

# HYBRID ESTIMATES OF PATH ATTENUATION FOR THE DPR

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Acknowledgements:

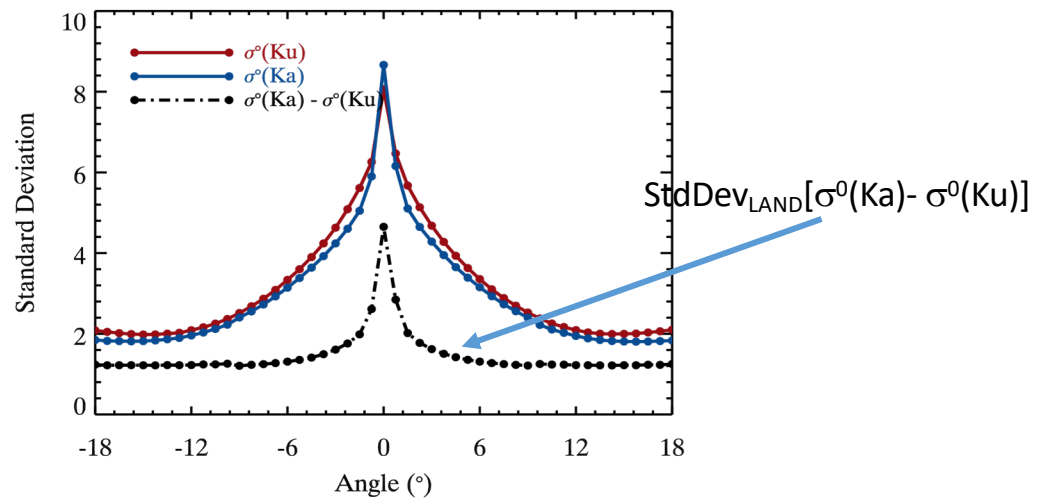
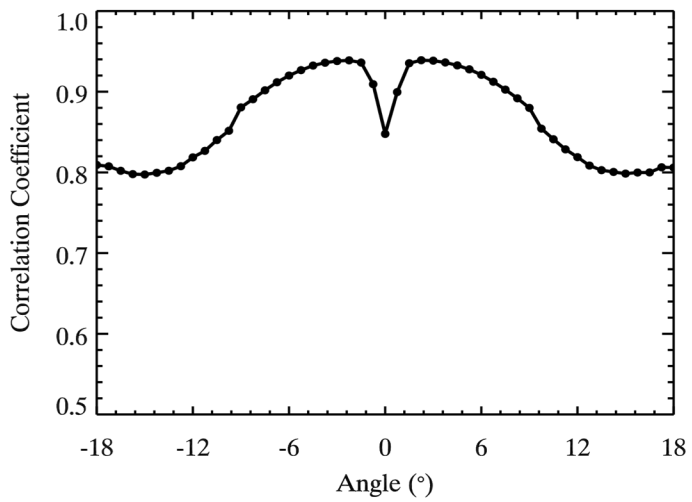
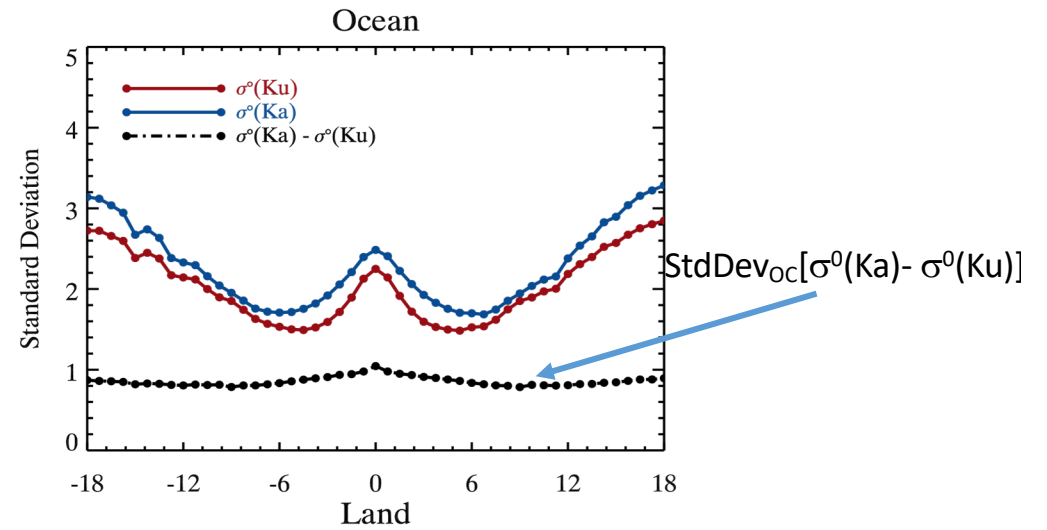
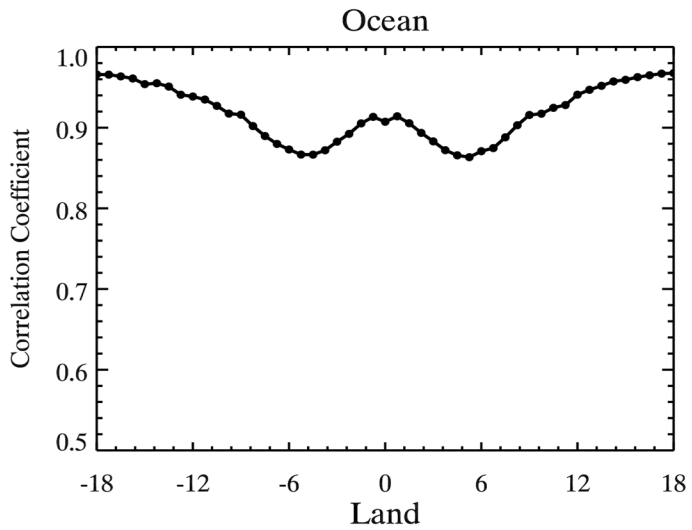
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## Outline

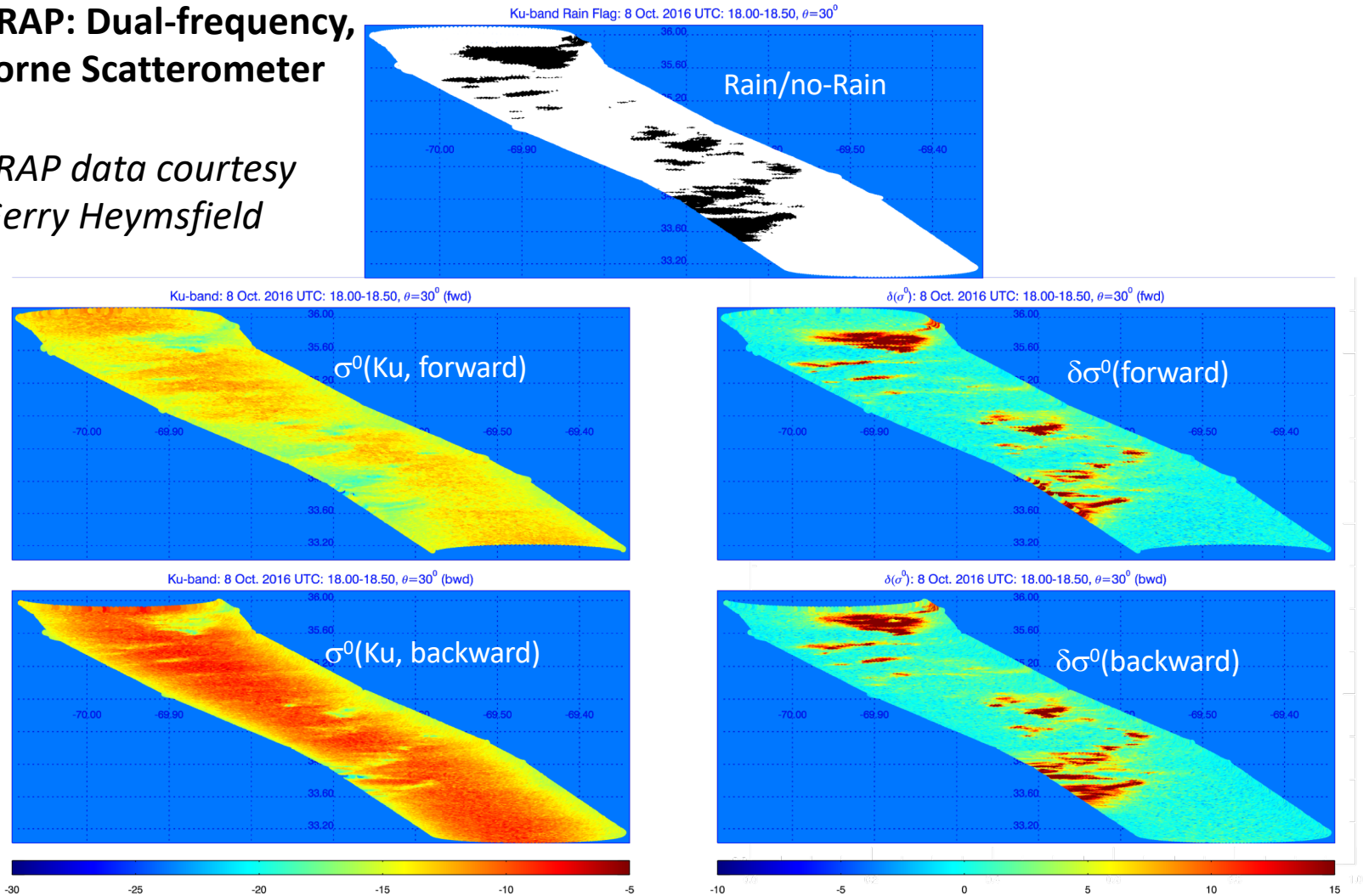
- Some preliminaries on dual-freq SRT
- Hybrid Estimates
- Various Attenuation Techniques
- Results using new Ka-band scan
- Summary

New scan Pattern Ex.(06/2018)

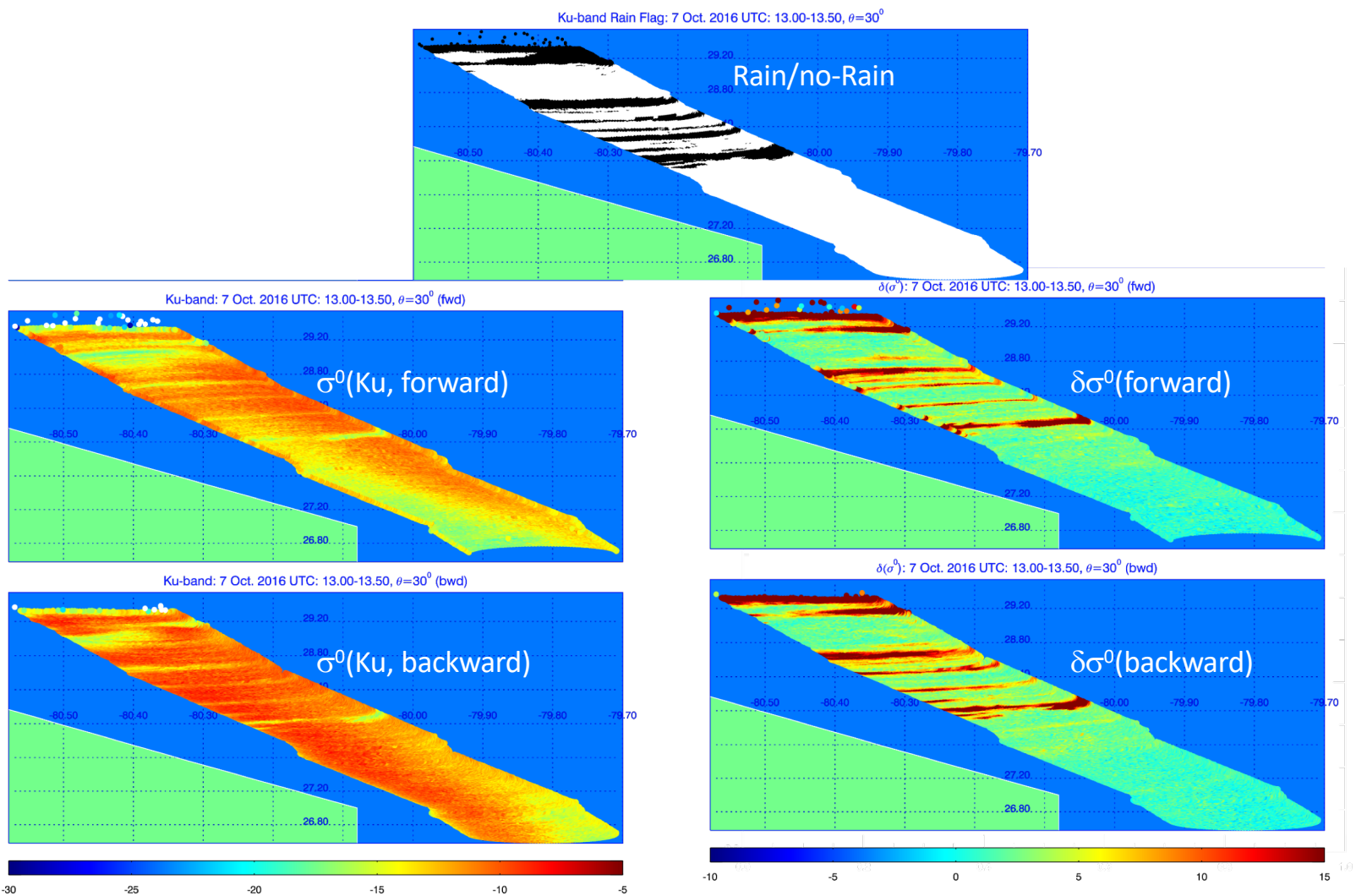


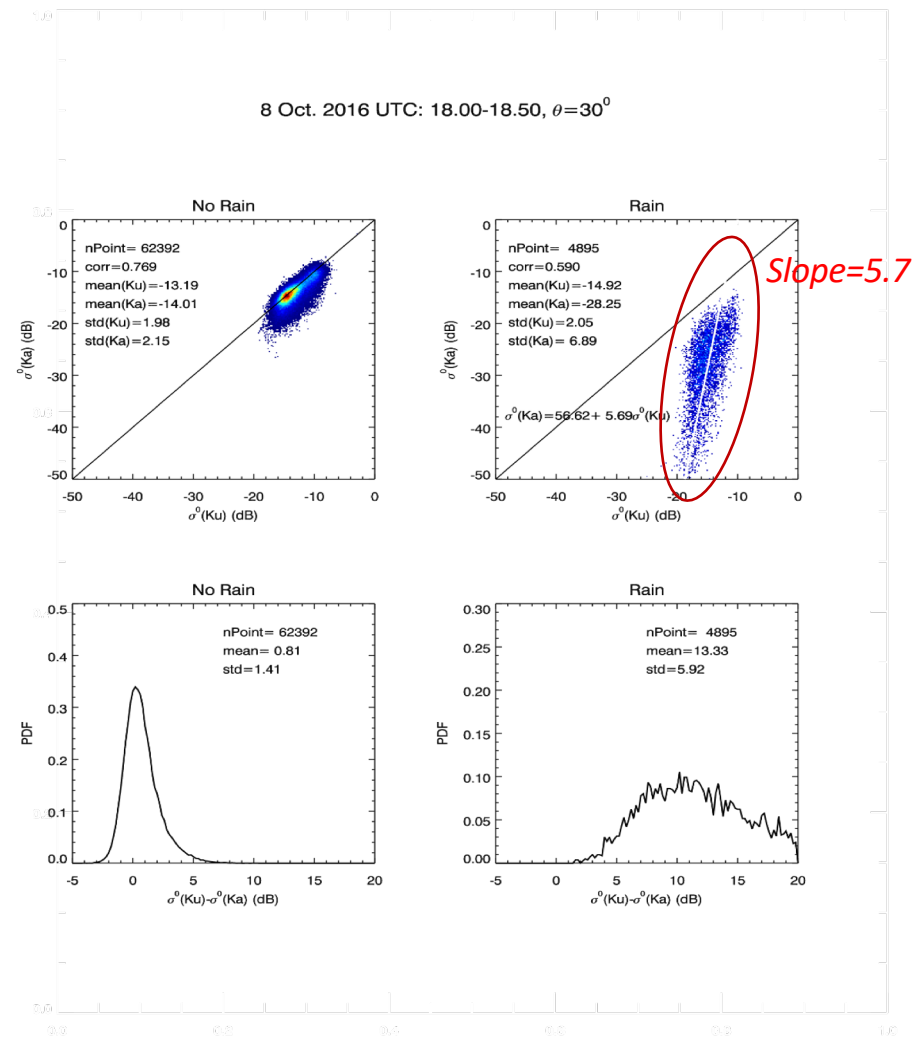
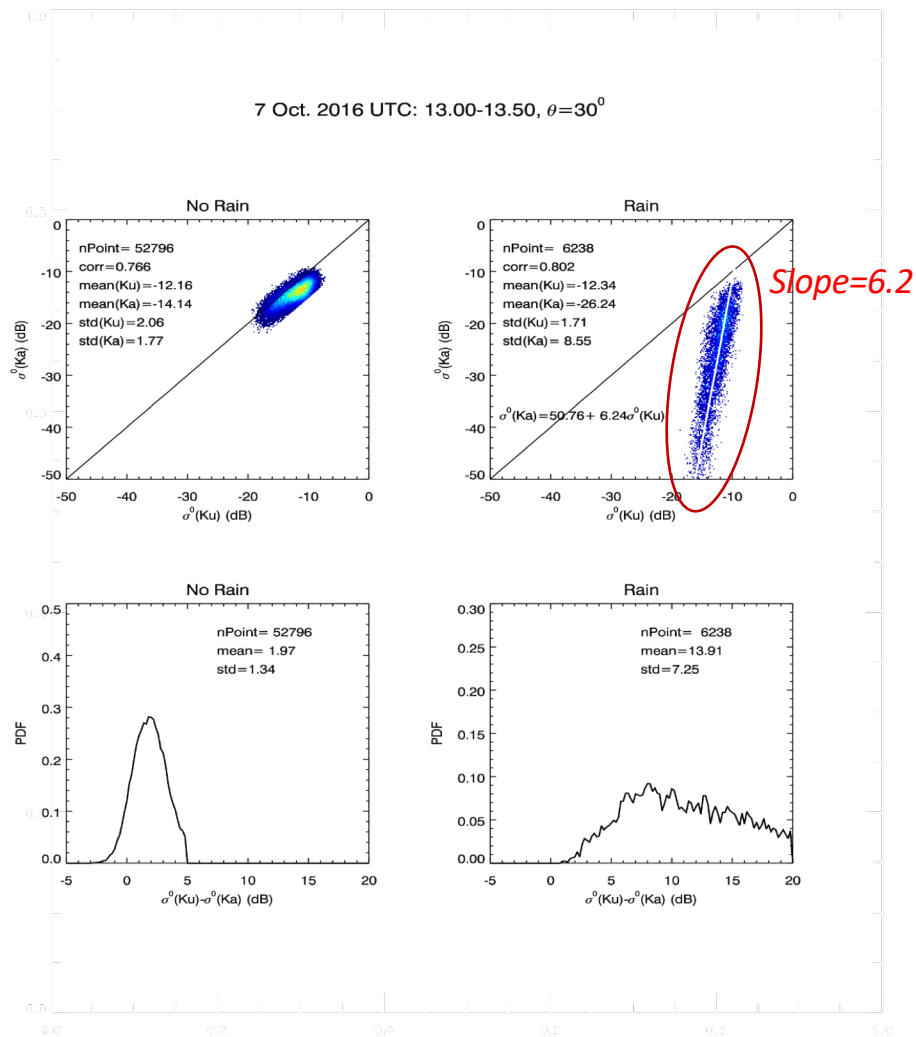
## HIWRAP: Dual-frequency, Airborne Scatterometer

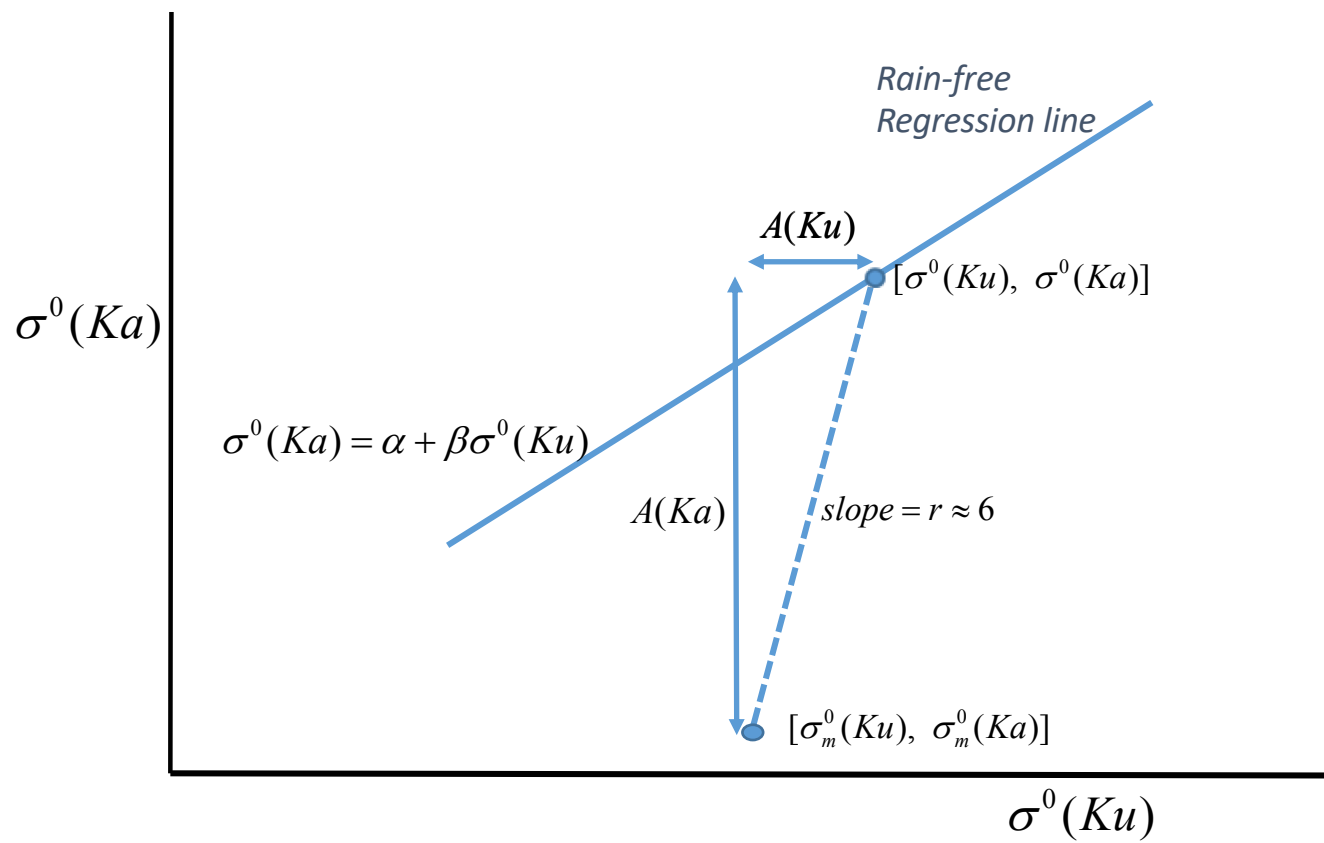
*HIWRAP data courtesy  
Dr. Gerry Heymsfield*



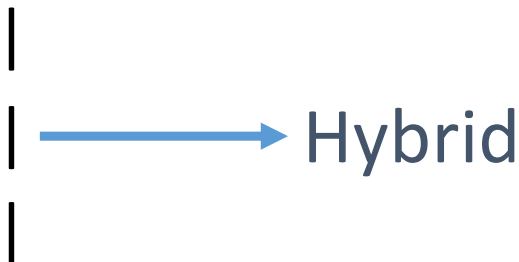








## Attenuation-correction methods available

- Hitschfeld-Bordan
  - Surface Reference
  - Standard Dual-Frequency
  - (Mirror-Image)
  - (Polarimetric:  $\phi_{DP} \rightarrow A$ )
  - (Differential-frequency Doppler:  $\delta v \rightarrow D_m$ )
- 
- A vertical list of six methods is shown. To the right of the list, a blue arrow points from the second item, 'Surface Reference', to the word 'Hybrid'.

# Hybrid Estimates

- If  $n$  independent estimates of a quantity  $A$  are available  $\{A_1, \dots, A_n\}$  and if the resultant estimate is written in the form

$$\hat{A} = \sum_{j=1}^n w_j A_j$$

Then the minimum variance of the  $A$  estimate is obtained by taking (method of Lagrange multipliers)

$$w_j = \tau_j / \sum_{j=1}^n \tau_j$$

$$\tau_j = 1 / \text{var}(A_j)$$

## Hybrid Estimates - continued

- This implies that the variance of the estimate is

$$\text{var}(\hat{A}) = 1 / \sum_{j=1}^n \tau_j$$

which is less than or equal to the variance of any individual estimate.

- This approach is being used for the SRT since we have up to 5 different estimates of the SRT-PIA, depending on the type of reference data used
- The critical issue is to estimate the variances for the HB, SRT & DW
  - (for the SRT, the variance is obtained from the sample variance of the reference data)

## Hybrid Estimates - continued

- Explicitly, for the dual-freq case:

$$\delta A_{HY} = w_{SRT} \delta A_{SRT} + w_{HB} \delta A_{HB} + w_{DW} \delta A_{DW}$$

- For the single-freq case, we have only 2 methods:

$$A_{HY} = w_{SRT} A_{SRT} + w_{HB} A_{HB}$$

- Some issues about how best to display the dual-freq results
  - Output files are set up to store Ku or Ka results, not differential
  - $\delta A_{HY}$ ,  $\delta A_{SRT}$ ,  $\delta A_{DW}$  are converted to Ku-band by multiplying by 5
  - For HB, we do not retain  $A_{HB}(\text{Ku})$  as computed from  $\delta A_{HB}$

# Hitschfeld-Bordan

- With a k-Z relationship and the measured radar reflectivities,  $Z_m$ , along the radar beam, an estimate for the attenuation-corrected radar reflectivity,  $Z$ , & path attenuation,  $A$  ( $\delta A$ ), can be made

$$Z(r) = Z_m(r) / [1 - \zeta(r)]^{1/\beta}$$

$$A_{HB}(r_{ns}) = -(10 / \beta) \log_{10}[1 - \zeta(r_{ns})]$$

$$\delta A_{HB}(r_{ns}) = 10 \log_{10}[(1 - \zeta(r_{ns}, Ku))^{1/\beta(Ku)} / (1 - \zeta(r_{ns}, Ka))^{1/\beta(Ka)}]$$

$$\zeta(r_{ns}) = 0.2\beta \ln 10 \int_0^{r_{ns}} \alpha(s) Z_m^\beta ds; \quad k = \alpha Z^\beta; \quad \delta A \equiv A(Ka) - A(Ku)$$



## Hitschfeld-Bordan - continued

- Estimate becomes unstable as attenuation increases
  - As  $\zeta \rightarrow 1$ ,  $A \rightarrow \infty$  (less useful at Ka-band than at Ku-band)
- Estimate depends on radar calibration
- Since  $\alpha$  (in k-Z relationship) depends strongly on phase state, knowledge of hydrometeor phase state along the path is important
  - This can be a significant problem in convective rain where mixed-phase layer is often not apparent
- Estimate is sensitive to non-uniform beam-filling (NUBF)

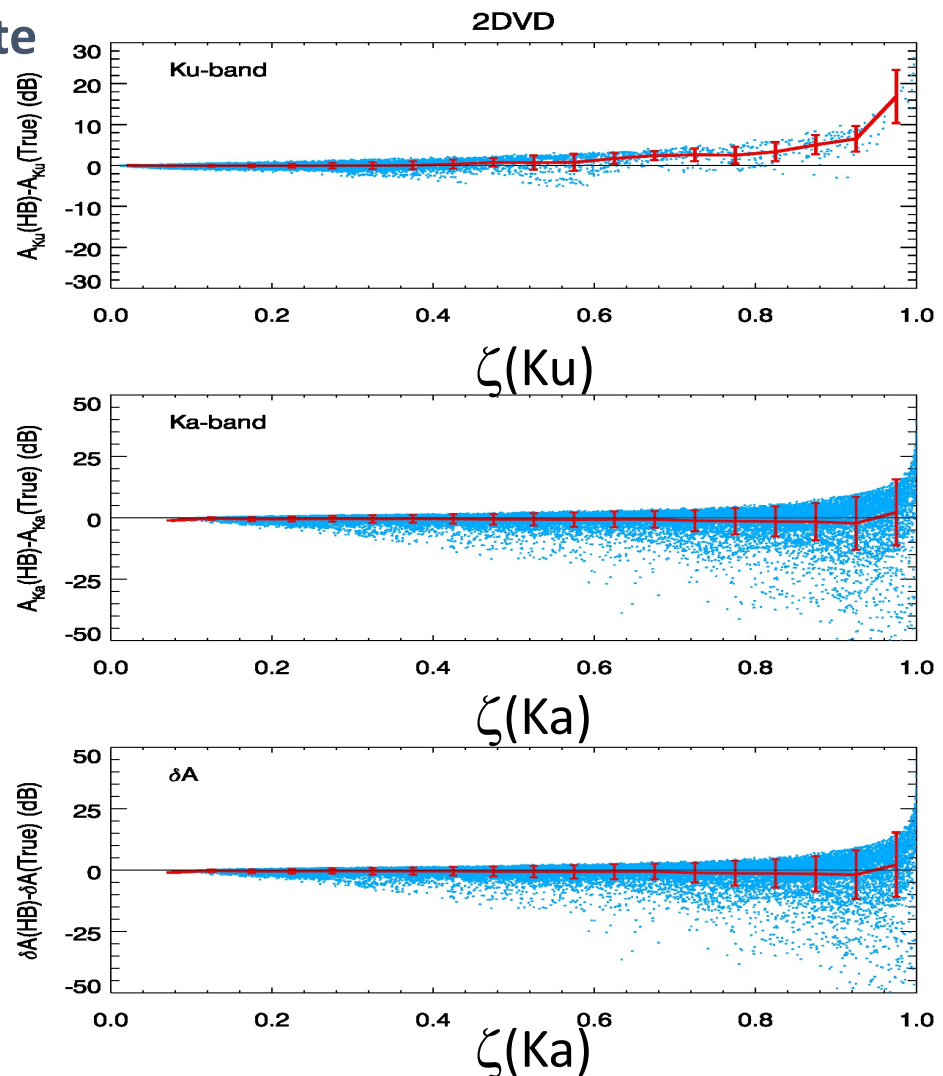
## Estimating error var of HB-PIA estimate

Use a temporal sequence of DSD's to represent DSD along path of the DPR

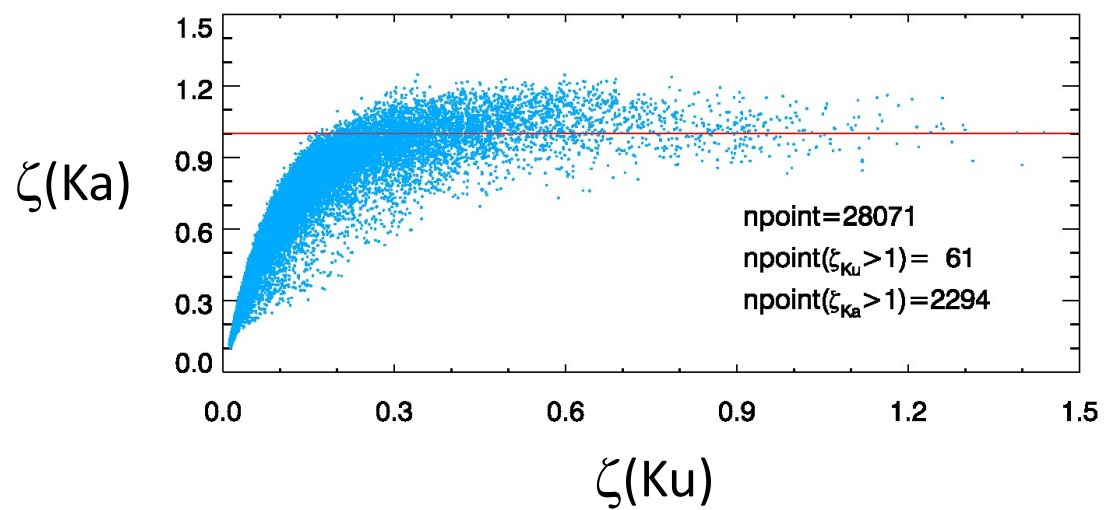
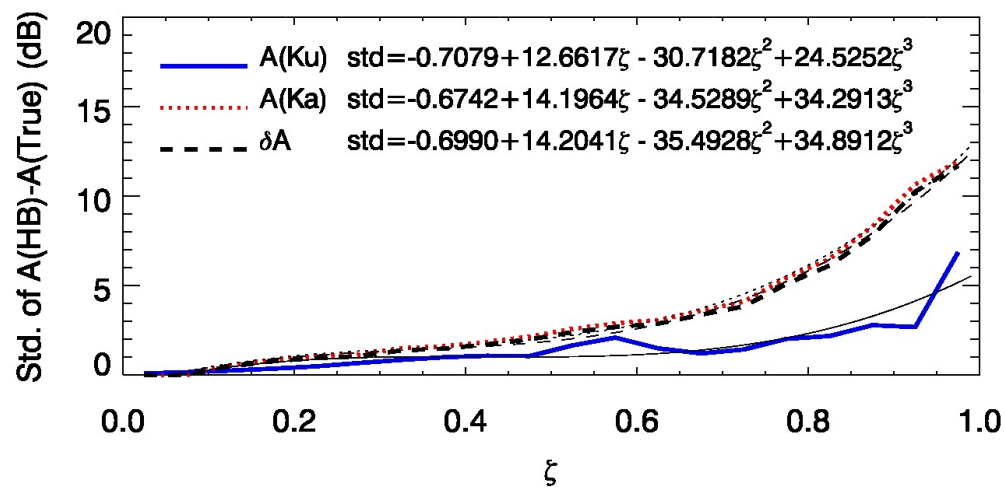
Compute  $\alpha$ ,  $\beta$  in k-Z relation from the full set of DSD data

Compute HB-PIA and true PIA for each sequence/path

Compute the mean & std dev of the difference between the two



## 2DVD



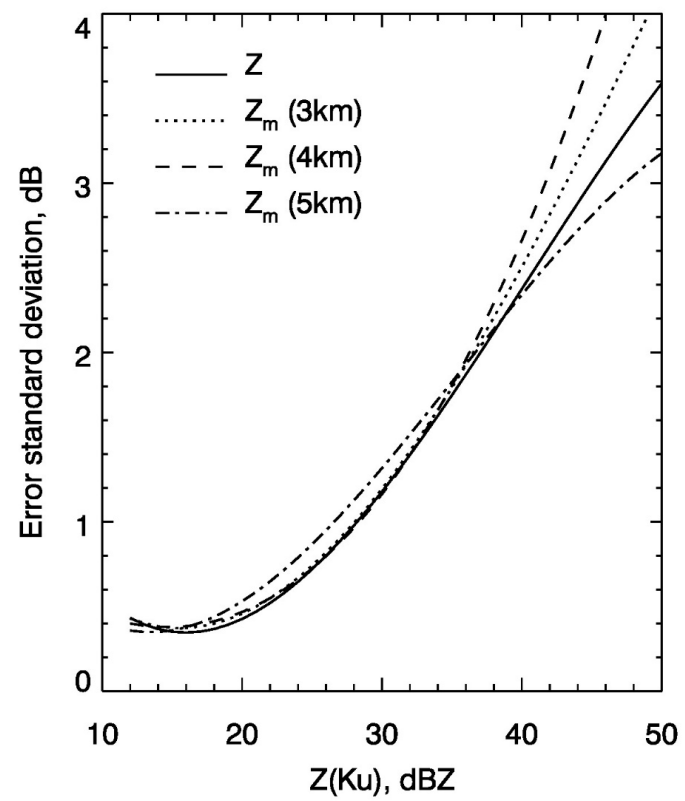
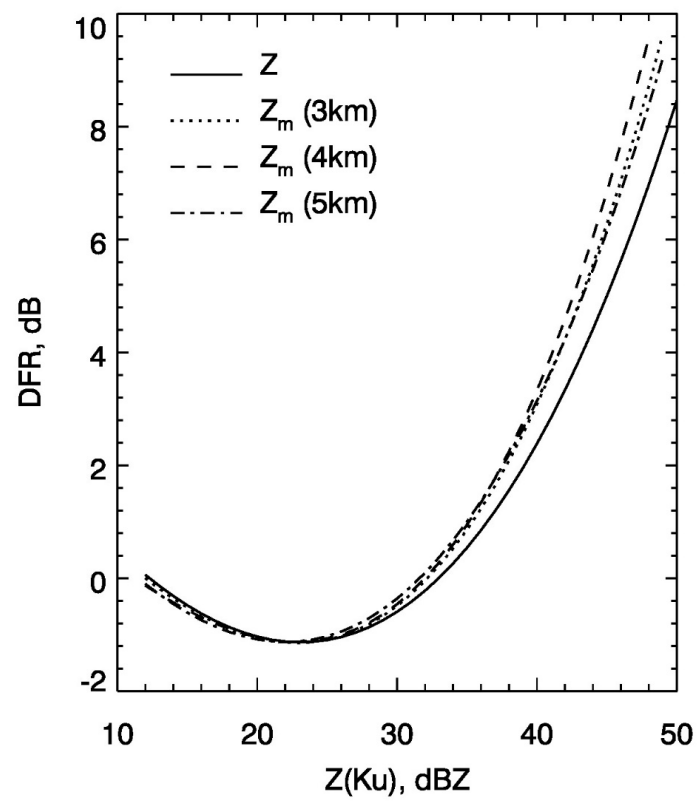
# Standard Dual-Frequency

- The differential path attenuation is equal to the difference between the measured,  $DFR_m$ , and actual dual-frequency ratio, DFR
  - This follows directly from the definitions of these terms
  - To a first approx., the DFR can be neglected
  - To a second-order approx., the DFR can be estimated from  $dBZ_m$  (near surface)

$$\delta A_{DW}(r_{ns}) = DFR_m(r_{ns}) - DFR(r_{ns})$$

$$\delta A_{DW}(r_{ns}) \approx [dBZ_m(Ku, r_{ns}) - dBZ_m(Ka, r_{ns})] - DFR(dBZ_m(Ku, r_{ns}))$$

- Largest error source is in approximating DFR
- Method should be less sensitive to NUBF than either HB or SRT



# Surface Reference Technique

- Given measurements of the normalized surface cross section inside and outside the rain,  $\sigma^0(\text{rain})$ ,  $\sigma^0(\text{no-rain})$ , an estimate of path attenuation (& differential path attenuation) is

$$A_{SRT} = \sigma^0(\text{no-rain}) - \sigma^0(\text{rain})$$

$$\delta A_{SRT} = \delta\sigma^0(\text{no-rain}) - \delta\sigma^0(\text{rain})$$

$$\delta\sigma^0 = \sigma^0(Ka) - \sigma^0(Ku)$$

$$\delta A = A(Ka) - A(Ku)$$

## Surface Reference Technique - continued

- Estimate is sensitive to fluctuations in  $\sigma^0$  ( $\delta\sigma^0$ )
  - Errors depend on incidence angle & surface type
  - Fluctuations in  $\delta\sigma^0$  tend to be smaller
    - high correlation between  $\sigma^0(\text{Ku})$ ,  $\sigma^0(\text{Ka})$
- Estimate is highly sensitive to NUBF
- Estimate is independent of radar constant

$$\mathrm{var}(A_{SRT}) = \left[ \sum_j \tau_j \right]^{-1} + \varepsilon; \quad \tau_j = 1 / \mathrm{var}(A_j)$$

$$\mathrm{var}(\delta A_{SRT}) = \left[ \sum_j \tau_j \right]^{-1} + \varepsilon; \quad \tau_j = 1 / \mathrm{var}(\delta A_j)$$

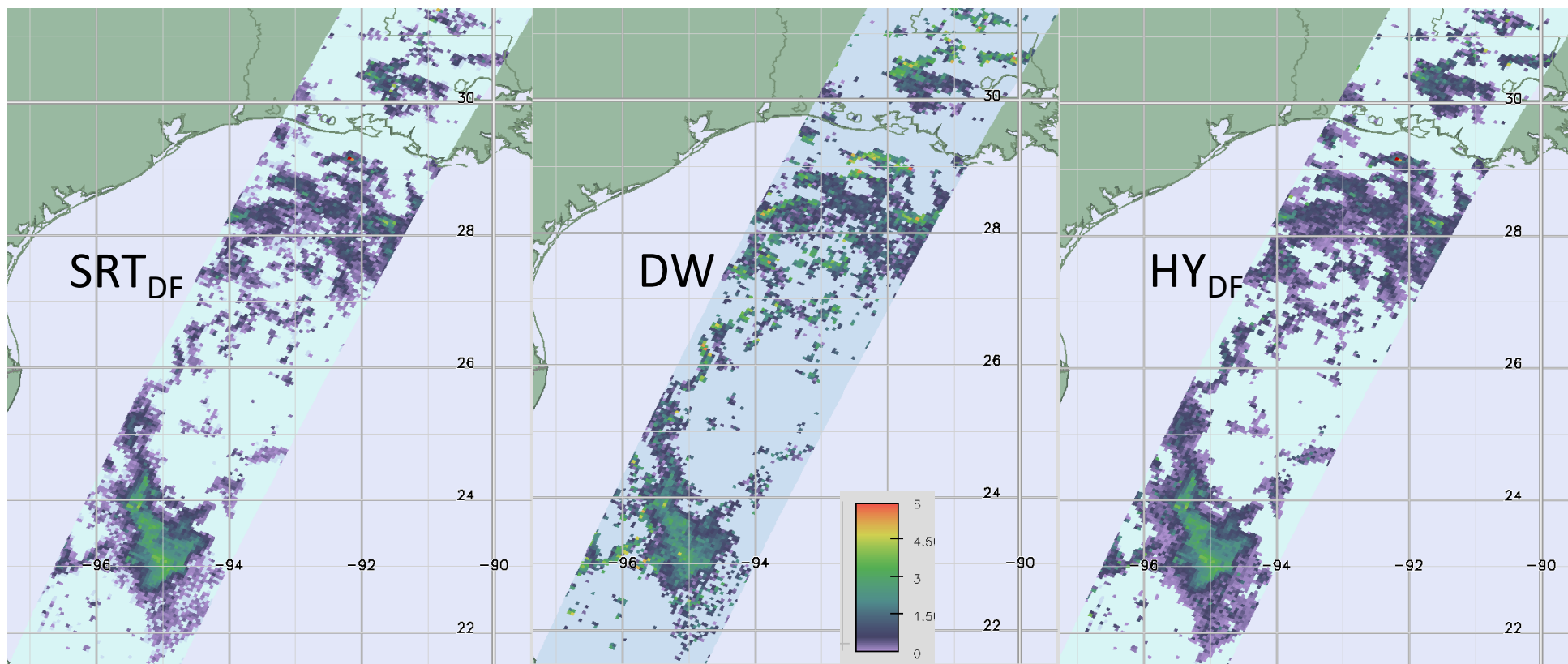
$$\varepsilon = \sum_j \tau_j (A_{SRT} - A_j)^2 / \sum_j \tau_j$$

$$\varepsilon = \sum_j \tau_j (\delta A_{SRT} - \delta A_j)^2 / \sum_j \tau_j$$

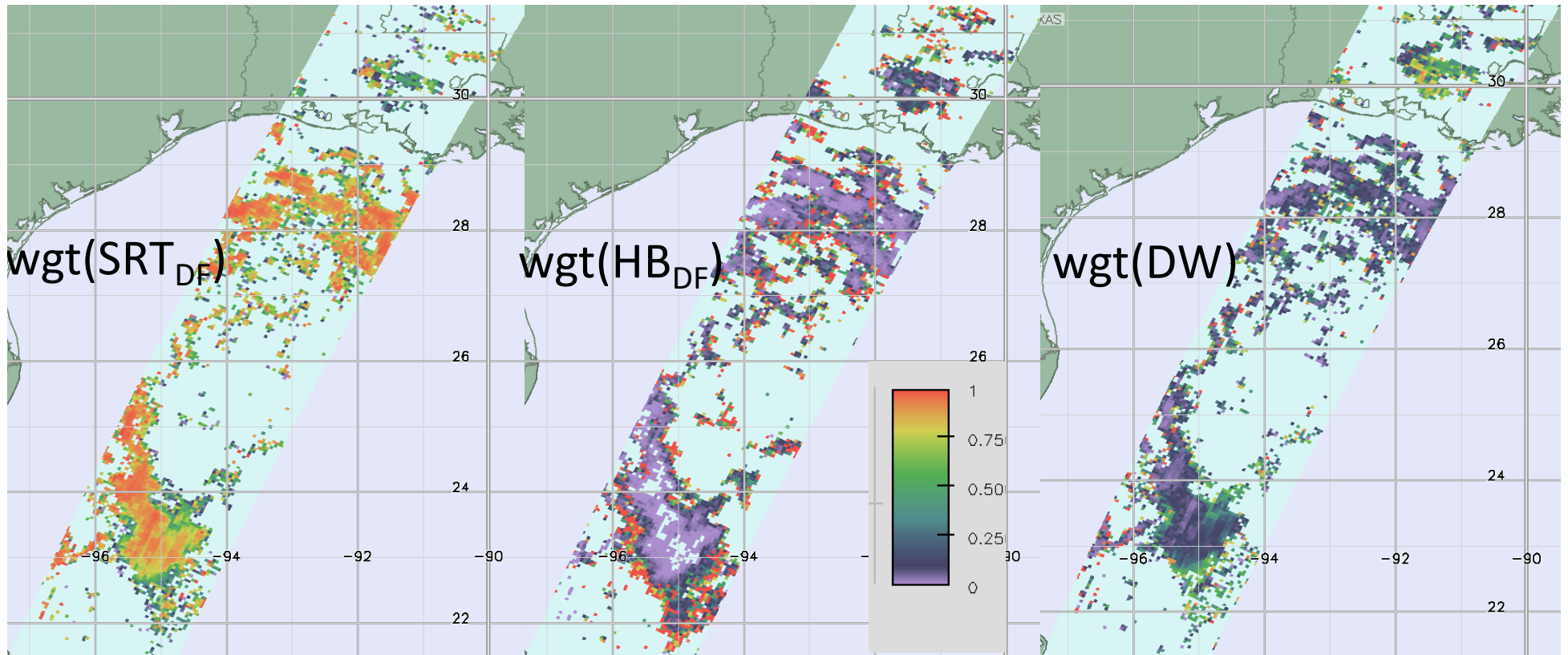


## Case 1

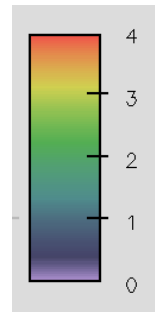
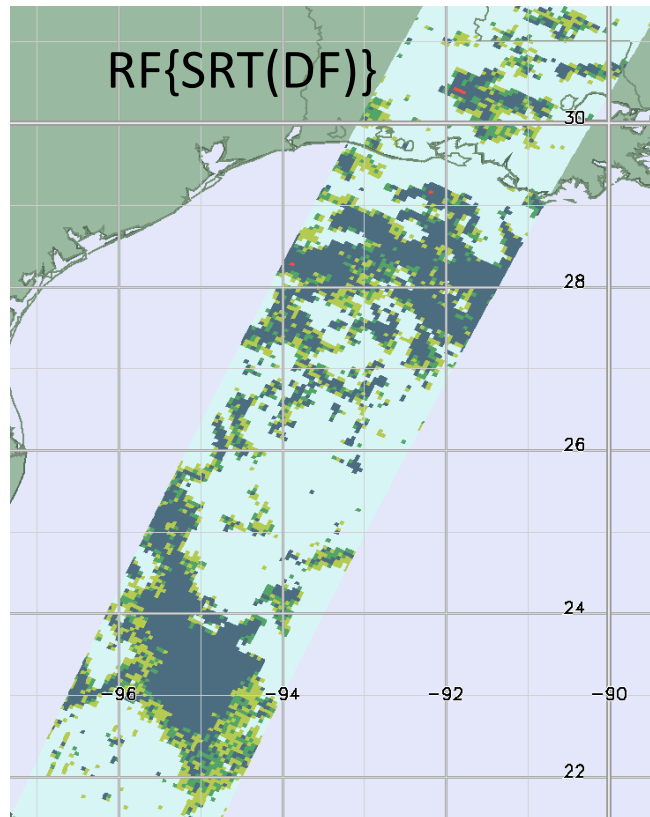
- Orbit: 25811
- Date: 2018/09/13
- Location: Gulf of Mexico
- New Ka-scan



Ku-band PIA from Dual-Freq Methods  
( $HB_{DF}$  used in hybrid but not shown/saved)

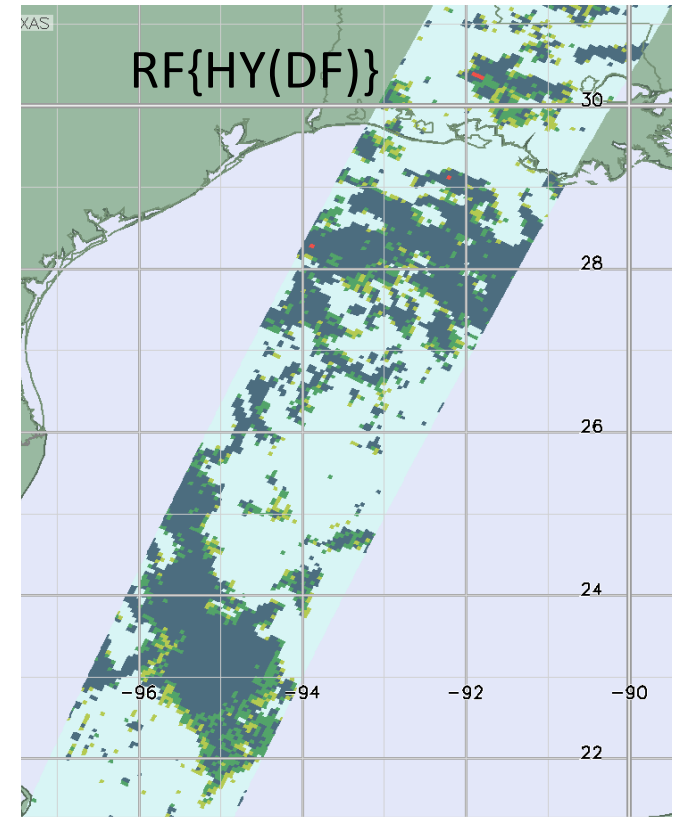


Weight factors used in Dual-Freq Hybrid Estimate of Ku-band PIA

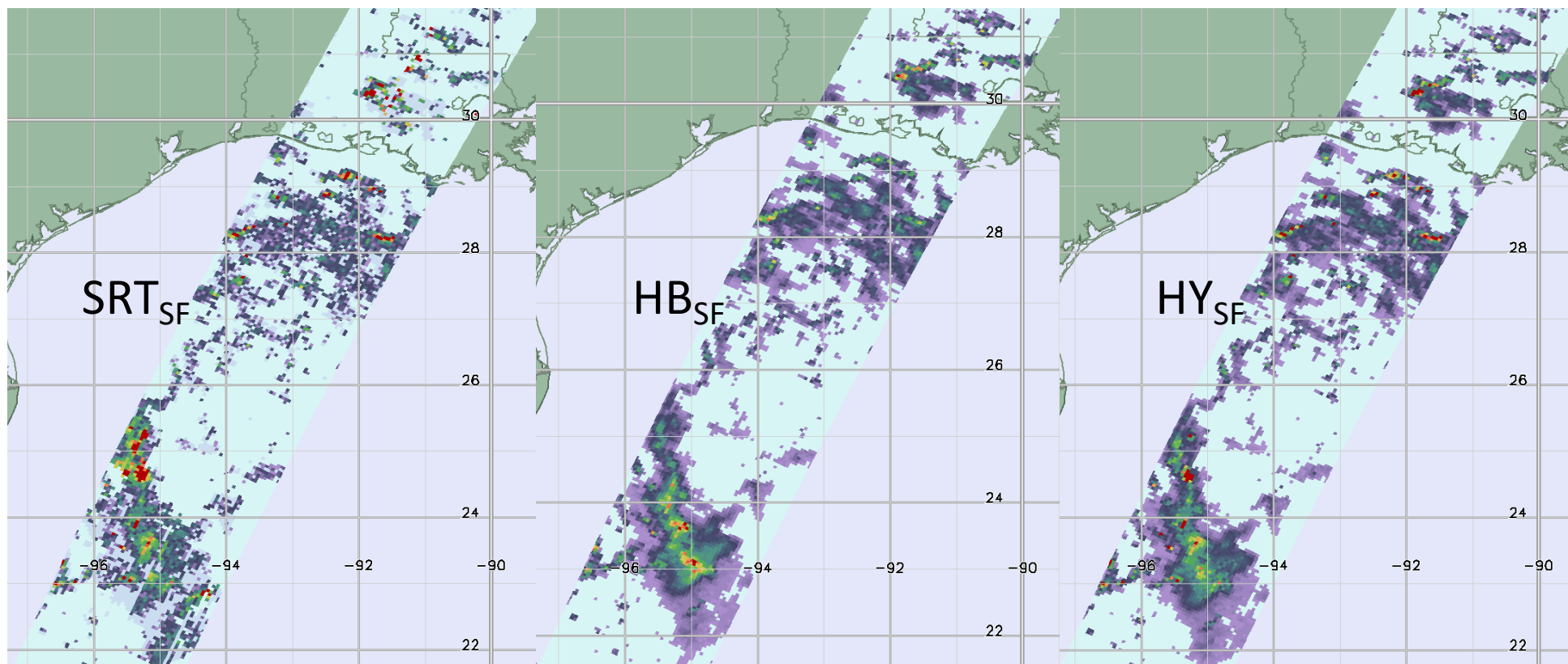


$$r = E(A)/\text{std}(A)$$

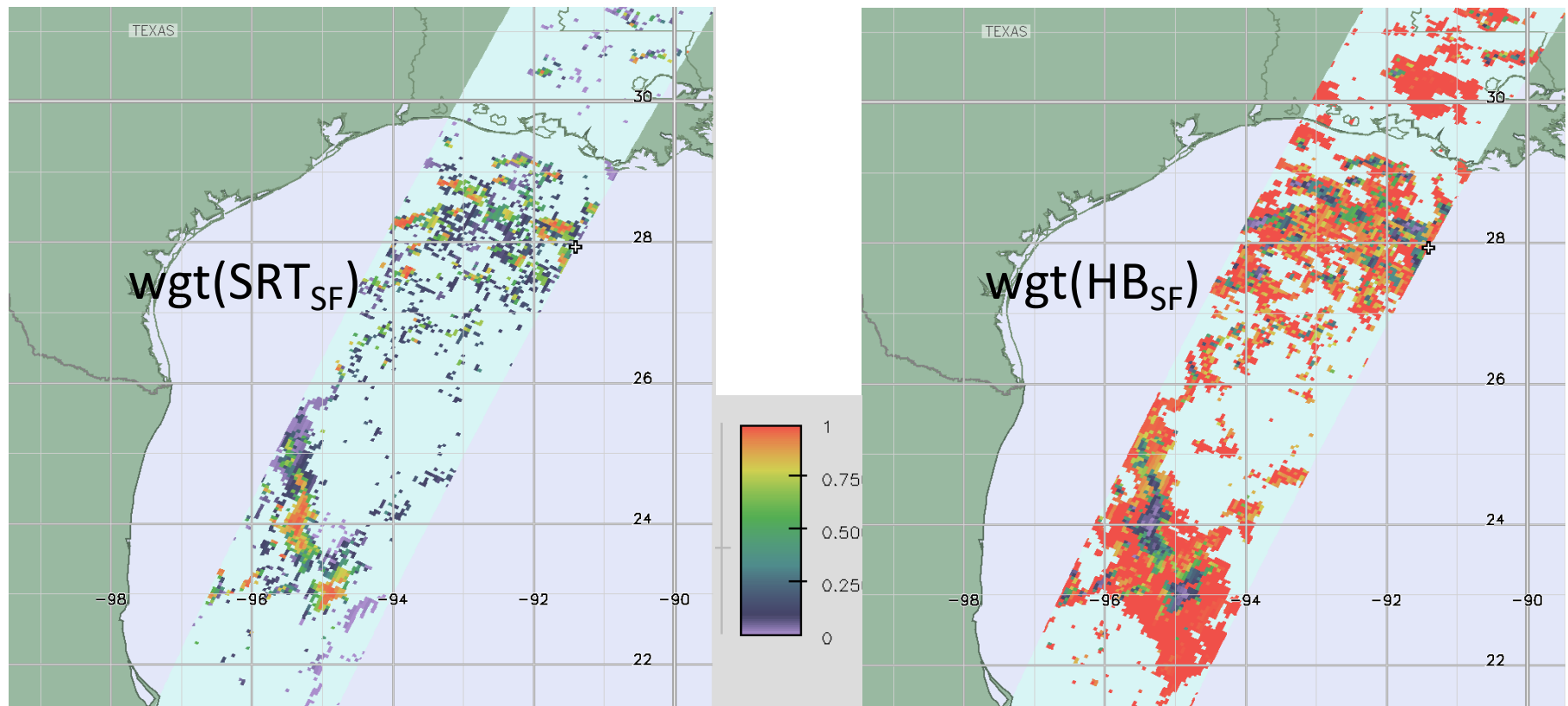
- RF=1 if  $r > 3$  (blue)
- RF=2 if  $1 < r < 3$  (green)
- RF=3 if  $r < 1$  (yellow)
- RF=4 if  $\text{SNR} < 2$  (red)



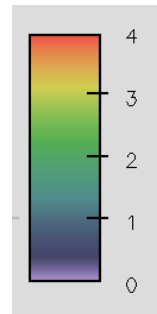
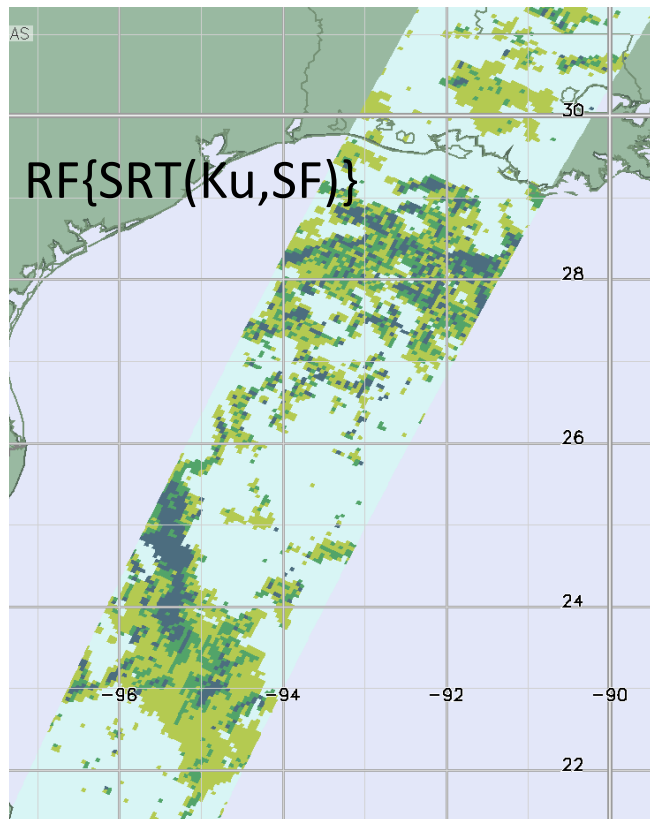
Reliability Flags for SRT(DF), left, and Hybrid(DF), right



Ku-band PIA from Single-Freq Methods

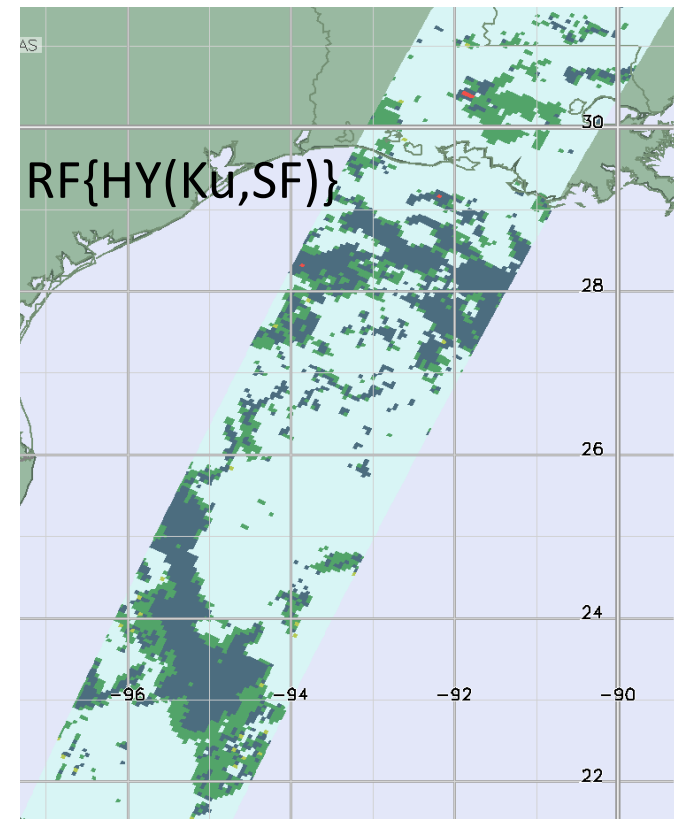


Weight factors used in Single-Freq Hybrid Estimate of Ku-band PIA



$$r = E(A)/\text{std}(A)$$

- RF=1 if  $r > 3$  (blue)
- RF=2 if  $1 < r < 3$  (green)
- RF=3 if  $r < 1$  (yellow)
- RF=4 if  $\text{SNR} < 2$  (red)

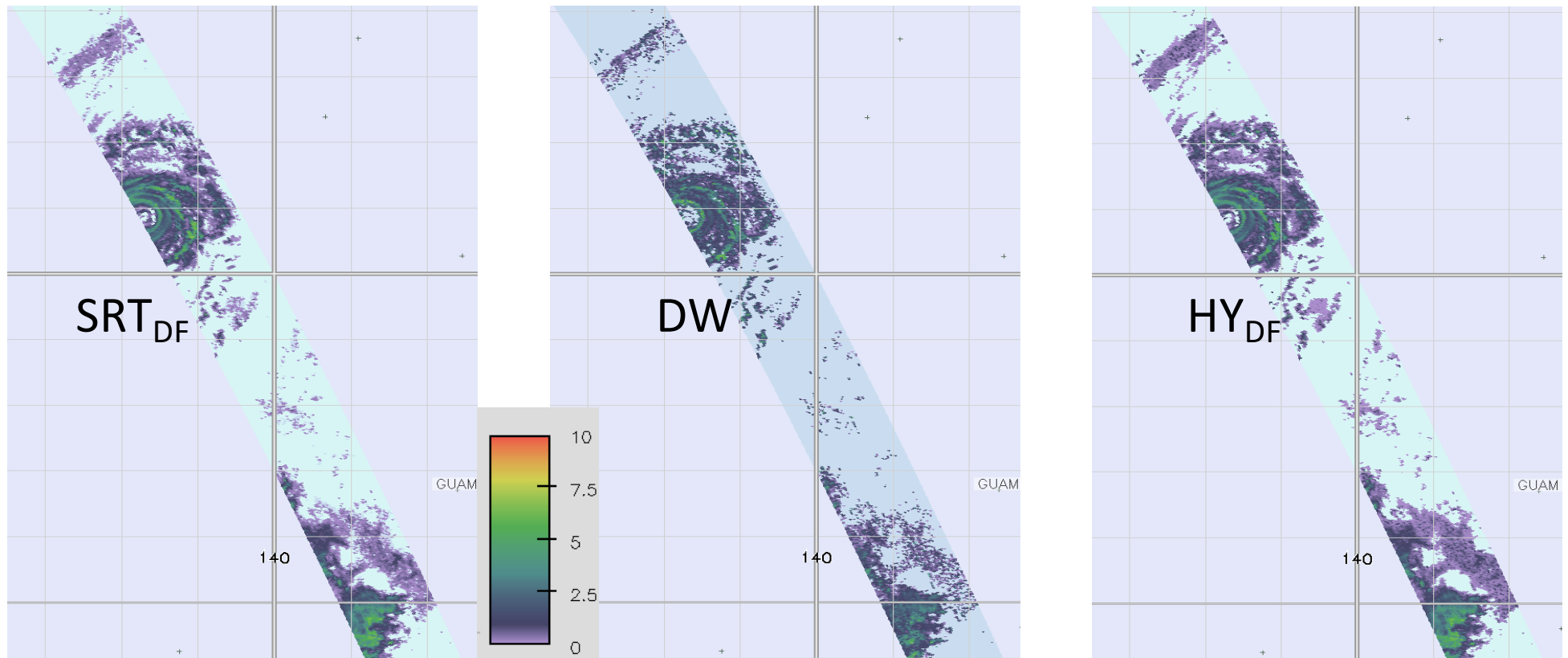


Reliability Flags for SRT(Ku, SF), left, and Hybrid(Ku, SF), right

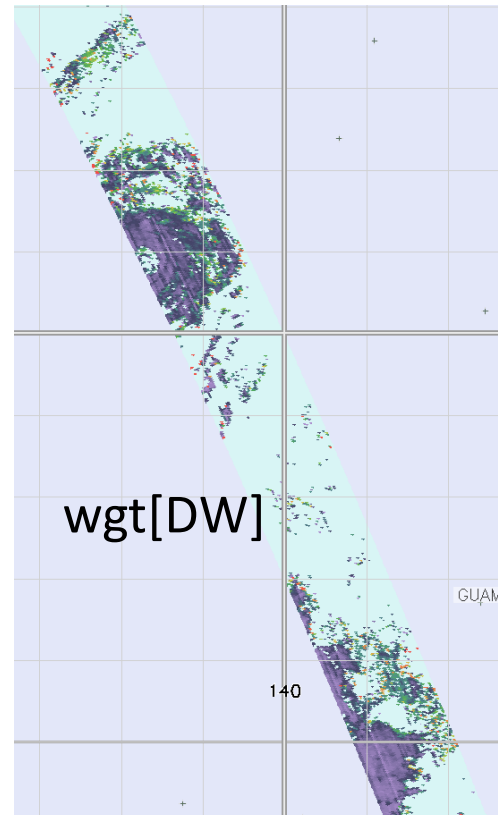
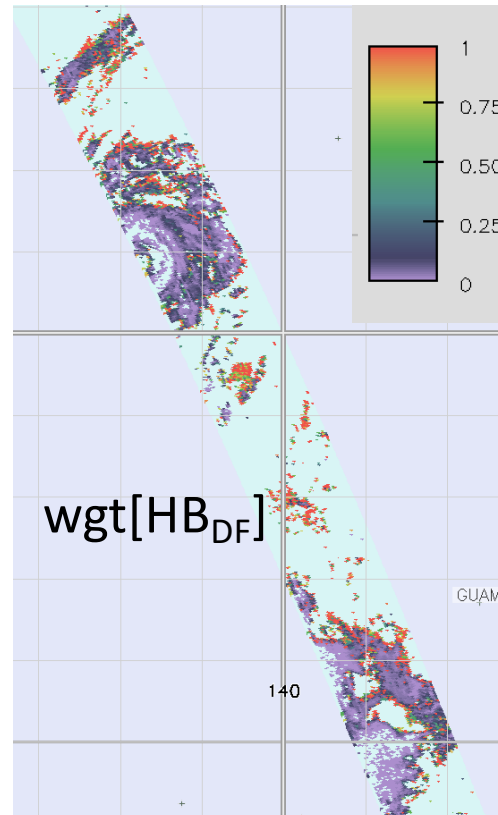
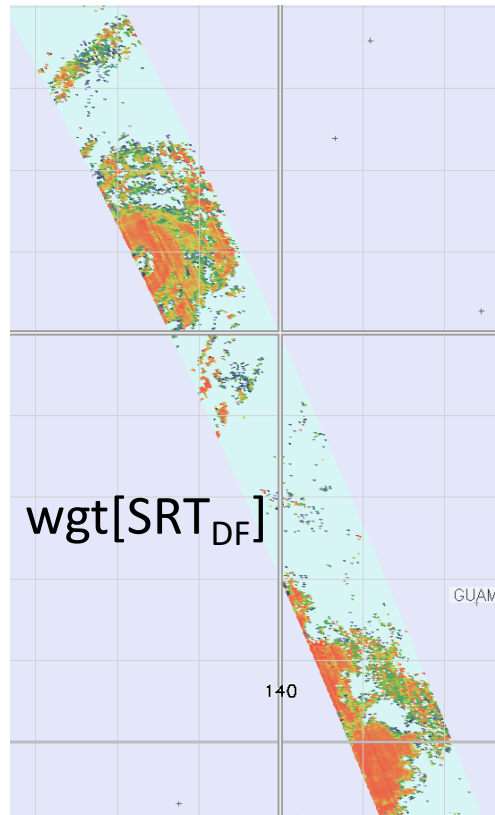
## Case 2

- Orbit: 25601
- Date: 2018/08/31
- Location: Typhoon, East of the Philippines
- New Ka-band Scan

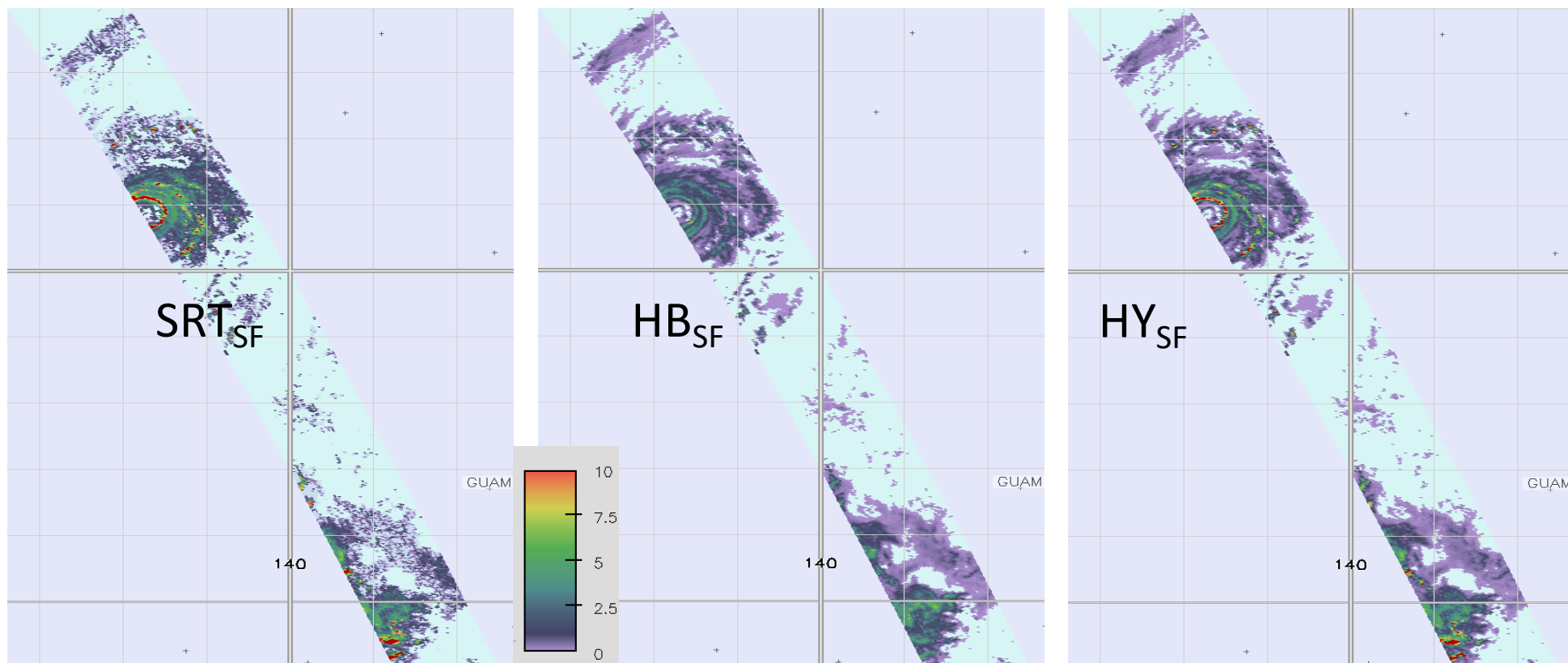




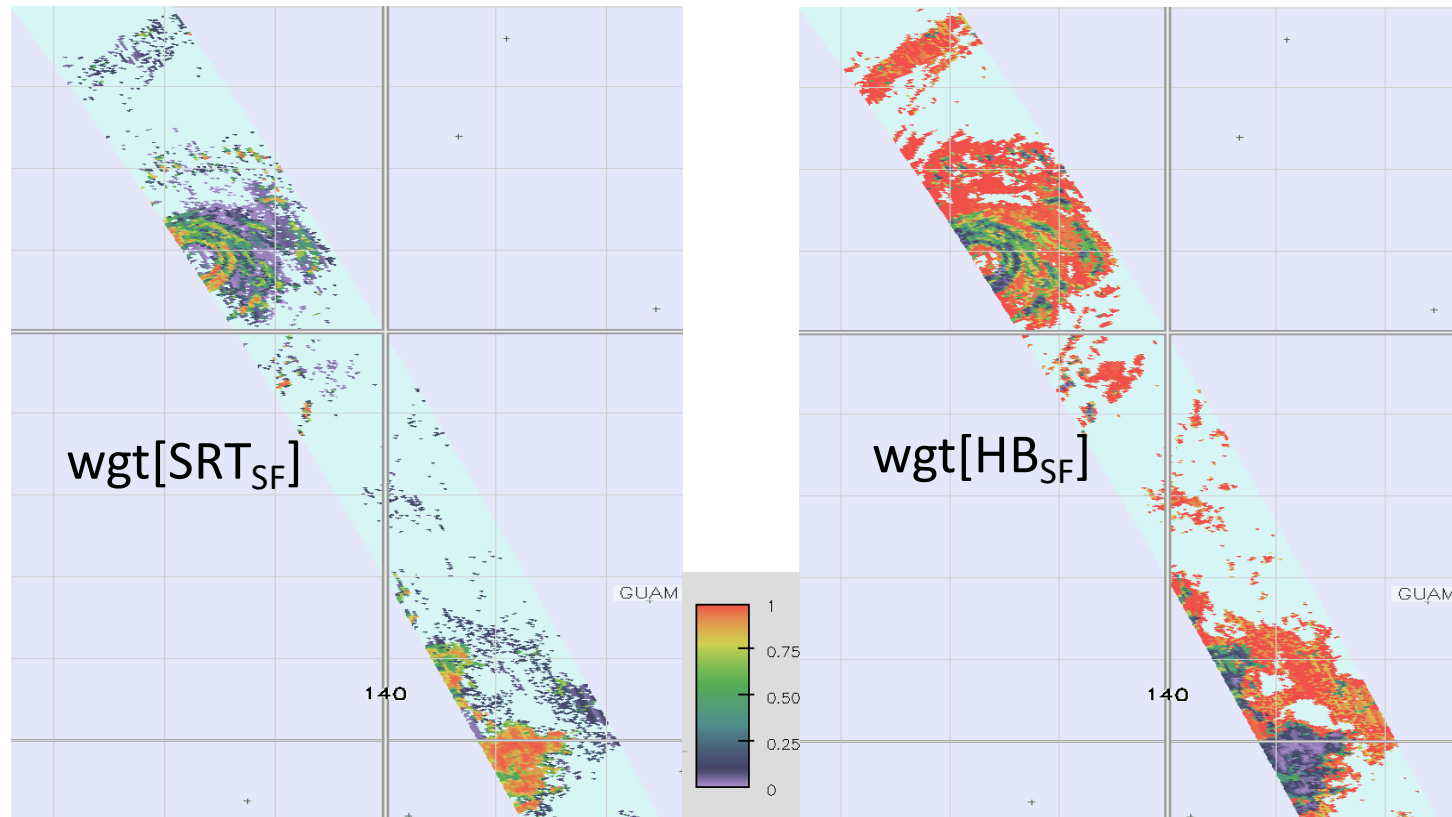
Ku-band PIA from Dual-Freq Methods  
( $HB_{DF}$  used in hybrid but not shown/saved)



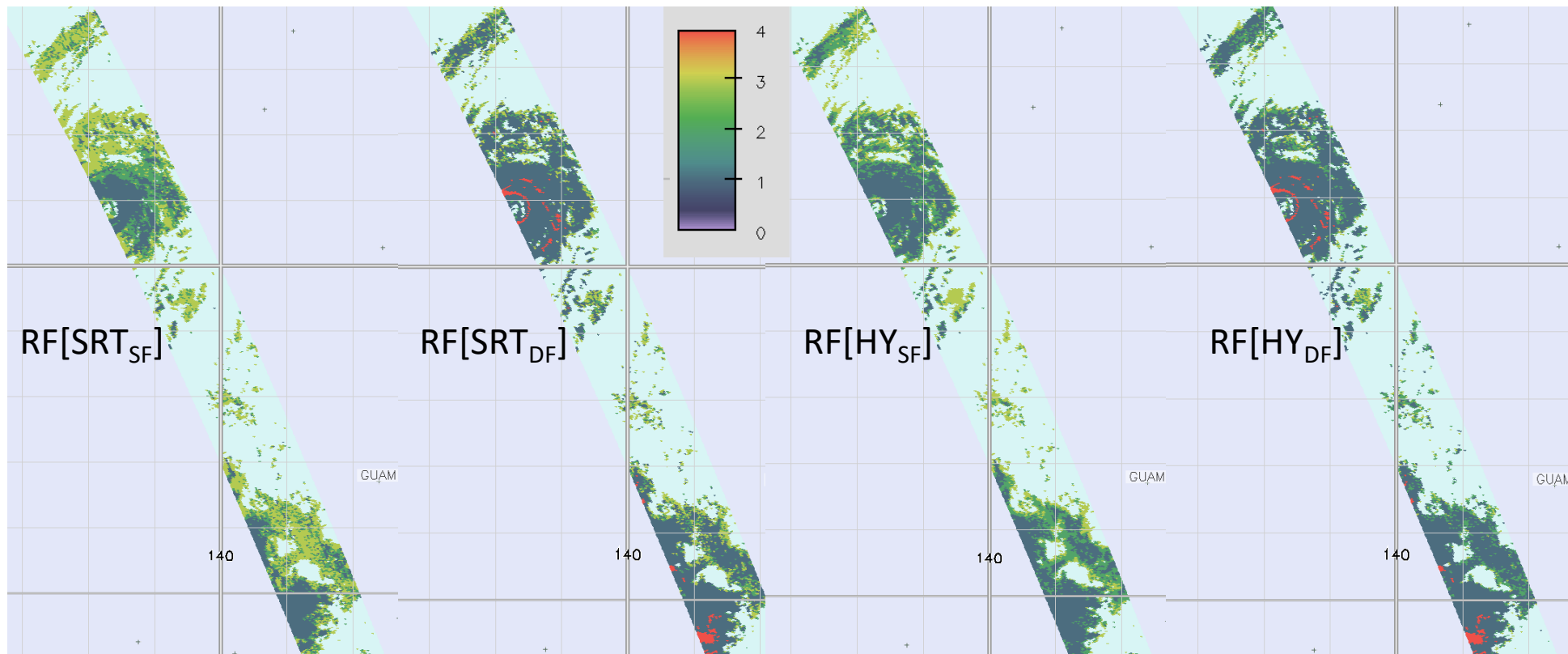
Weight factors used in Dual-Freq Hybrid Estimate of Ku-band PIA



Ku-band PIA from Single-Freq Methods



Weight factors used in Single-Freq Hybrid Estimate of Ku-band PIA



Reliability Flags at Ku-band for single/dual-freq SRT (left) and single/dual-freq Hybrid (right)

RF=1 if  $r > 3$  (blue)  
 RF=2 if  $1 < r < 3$  (green)  
 RF=3 if  $r < 1$  (yellow)  
 RF=4 if  $SNR < 2$  (red)

# Summary

- $\sigma^0$  statistics from the new Ka-band full scan look good
  - DSRT can be used over the full swath with improved estimates of path attenuation
- The hybrid formulation is motivated by the desire to obtain the most accurate estimate of path attenuation by combining existing methods
- Results: Focus on preliminary results from the new data
- At moderate to high PIA, DSRT tends to be weighted most strongly, esp over ocean, followed by DW and HB
- At low values of PIA, HB tends to dominate

## Summary - continued

- Reliability factor/flag indicates that hybrid estimate is more accurate than SRT/DSRT; for single-freq, significantly so
- Though the dual-freq results generally appear to be more accurate than those from single-freq, this is not the case when we have loss of rain or surface signal at Ka-band
- A critical part of the procedure depends on the variances assigned to the SRT, HB and DW
- Results are preliminary & there are issues to be addressed